# Genie

#### Overview of version 3 major release

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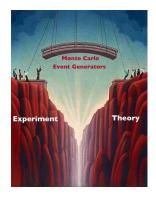
on behalf of GENIE collaboration



University of Liverpool

16 October 2018 NuInt - GSSI L'Aquila

#### Neutrino MC generators: our vision



- Connect neutrino fluxes and observables.
  - event topologies and kinematics
- Good generators
  - optimal coverage of physics processes
  - Uncertainty validation
  - Tune the physics models
- Specific requirements for experiments
  - fast enough for MC analyses
  - being able to prove the validity of a configuration
  - ⇒ Simple models can be perfectly acceptable

# Neutrino MC generators: our vision



- Connect neutrino fluxes and observables
  - event topologies and kinematics
- Good generators
  - optimal coverage of physics processes
  - Uncertainty validation
  - Tune the *physics* models
- Specific requirements for experiments
  - fast enough for MC analyses
  - being able to prove the validity of a configuration
  - ⇒ Simple models can be perfectly acceptable
- ⇒ Tuning is difficult CPU time
  - ⇒ Unprecedented systematic tuning program

#### We don't believe in a perfect theory approach

- There are always things that need to be derived from measurements
- ⇒ Dealing with errors is unavoidable



# Roles of generators in oscillation physics

- Compare data and models
  - Reliability and validity region
  - ⇒ You cannot study oscillations without fully understood models
- Compare dataset against dataset
  - Data quality and data sources are increasing ⇒ tensions
  - ⇒ joint analyses
  - ⇒ comparing results from different experiments
- Global fits
  - A generator is the ideal place for global fits
    - Controls the model implementation
  - Finding the best parameters
  - Cross Section priors based on data
- Feedback for experiments
  - Drive the format of cross section releases
  - Hint toward key measurements



Status

#### **GENIE Collaboration**

Luis Alvarez Ruso<sup>8</sup>, Costas Andreopoulos<sup>2,5</sup>, Christopher Barry<sup>2</sup>, Francis Bench<sup>2</sup>, Steve Dennis<sup>2</sup>, Steve Dytman<sup>3</sup>, Hugh Gallagher<sup>7</sup>, Steven Gardiner<sup>1</sup>, Walter Giele<sup>1</sup>, Robert Hatcher<sup>1</sup>, Libo Jiang<sup>3</sup>, Rhiannon Jones<sup>2</sup>, Igor Kakorin<sup>4</sup>, Konstantin Kuzmin<sup>4</sup>, Anselmo Meregaglia<sup>6</sup>, Donna Naples<sup>3</sup>, Vadim Naumov<sup>4</sup> Gabriel Perdue<sup>1</sup>, Marco Roda<sup>2</sup>, Jeremy Wolcott<sup>7</sup>, Júlia Tena Vidal<sup>2</sup>, Julia Yarba<sup>1</sup>

[ Faculty, Postdocs, PhD students]

- 1 Fermi National Accelerator Laboratory, 2 University of Liverpool, 3 University of Pittsburgh, 4 JINR Dubna,
- 5 STFC Rutherford Appleton Laboratory, 6 CENBG Université de Bordeaux, 7 Tufts University, 8 Valencia University

#### Core GENIE mission - from GENIE by-law

- Framework "... provide a state-of-the-art neutrino MC generator for the world experimental neutrino community ..."
- Universality "... simulate all processes for all neutrino species and nuclear targets, from MeV to PeV energy scales ..."
  - Global fit "... perform global fits to neutrino, charged-lepton and hadron scattering data and provide global neutrino interaction model tunes ..."



#### Status overview

Generators for experiments

- Well established generator
  - Used by many experiments around the world
  - Fermilab experiments are driving the momentum
    - Lot of interest from LAr experiments
- Two main efforts
  - Model development
    - Mostly happen during the latest releases of GENIE v2
    - arowing interest from theorists wanting to supply new models
  - Tuning
    - ⇒ Entering the tuning phase
- The new release v3
  - Interface with the developments
  - ⇒ Tunes against public datasets
  - ⇒ Easy way to share configurations
    - Experiments can propose their own configuration for others to use

#### Models

Models

- Steady introduction as alternate models
- Many thanks to all who contributed
  - more detailed list in backup
- List of most interesting physics introduction:
  - Valencia complete QE+MEC+LFG model
  - Berger-Sehgal resonance model+MiniBooNE form factors
  - Berger-Sehgal coherent model + updated Rein-Sehgal coherent
  - Single kaon production of Athar et al.
  - New cascade FSI model with medium corrections for pions and nucleons
  - ⇒ See Libo's talk

#### A complete generation needs more than a set of models

- The experimental smearing mixes all the different interaction process
- There are ad-hoc solutions in every generator that needs tuning
  - ⇒ Transition between RES and DIS interactions
  - ⇒ See Júlia's talk

#### Database and validation

Database

- Comparing GENIE predictions against public datasets
  - Modern Neutrino Cross Section measurement
    - nuclear targets
    - MiniBooNE, T2K, MINERvA
  - Historical Neutrino Cross Section Measurement
  - Measurements of neutrino-induced hadronic system characteristics
    - e.g. Forward/backward hadronic multiplicity distributions
  - Measurements of hadron-nucleon and hadron-nucleus event characteristics
    - FSI tuning
    - For pion, kaons, nucleons and several nuclear targets
    - Spanning hadron kinetic energies from few tens MeV to few GeV
  - Semi-inclusive electron scattering data
    - electron-nucleus QE data
    - electron-proton resonance data
- ⇒ Validation based on neutrino, electron and hadron beams simulations
  - We are not limited to simulate only neutrinos



 Generators for experiments
 GENIE
 New Genie tools
 Conclusion

 OO
 OOOO
 OOOO
 OO

#### **GENIE Version 3**



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graphics by grafiche.testi@gmail.com

- Interface with the work behind the scenes
- ⇒ "Comprehensive Model Configurations"
  - Self-consistent collections of primary process models
  - Help cooperation between collaborations
    - Unified model identifications
  - single command-line flag
    - --tune G18\_02a\_00\_000
  - Complete characterisation against public data
  - Possibility to host configurations provided by experiments
  - Access to tunes against datasets
    - same interface
    - Documentation:
      - Manual
      - Dedicated web page tunes.genie-mc.org/

# Comprehensive Model Configurations

CMC of interest

Generators for experiments

- G18\_01a and G18\_01b Default + MEC
  - with Empirical MEC
  - CCQE process is Llewellyn Smith Model
  - Dipole Axial Form Factor Depending on  $M_A = 0.99 \, GeV$
  - Nuclear model: Fermi Gas Model Bodek, Ritchie
  - Inclusion of diffractive and Lambda production models
- G18\_02a and G18\_02b Improved pion production models
  - Similar to G18\_01a and G18\_01b
  - Berger-Sehgal for resonant interaction
  - Berger-Sehgal for coherent interaction
- G18\_10a/b and G18\_10i/j Theory based model
  - Nieves' MEC
  - CCQE process is Nieves
  - Dipole Axial Form Factor (a/b) Depending on  $M_A = 0.99 \, GeV$
  - Z-expansion (i/j)
  - Nuclear model: Local Fermi Gas Model
- G00 00a Historic Default
  - now deprecated
- Dark matter ⇒ GDM18\_00a
- Low energy ⇒ GVLE18\_01a



# Technical updates

- New Git Repository https://github.com/GENIE-MC
  - Contributions are welcome through this new channel
  - Thanks to HEPForge for the many years of support
- Reweight is now a detached and independent repository
- Website http://www.genie-mc.org/
- Updated manual hosted on a dedicated DocDB
- Code
  - System handles multiple configurations
  - Updated XML file structure ⇒ safer and with no redundancies
  - Files re-organisation

# **Tuning**

- Why tuning?
  - Constraint parameters
  - Provide specific tunes for experiments
    - Liquid Argon tune
- Expected Output:
  - Parameter sets from data from various experiments
  - with estimated systematic errors
    - Parameter covariance matrix
    - ⇒ No official support until v4
- Numerical methodology
  - Old problem in High Energy Physics
    - CPU demanding
  - Solution found in the Professor suite
    - http://professor.hepforge.org
  - Numerical assistant
    - Developed for ATLAS experiment

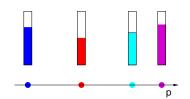


Parameterisation instead of a full MC

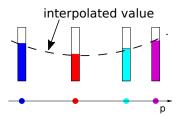
- Parameterisation instead of a full MC
  - Select points of param space



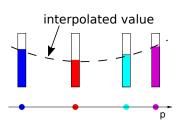
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  - Evaluate bin's behaviour with brute force



- Parameterisation instead of a full MC
  - Select points of param space
  - Evaluate bin's behaviour with brute force
  - Parameterisation I(p)



- Parameterisation instead of a full MC.
  - Select points of param space
  - Evaluate bin's behaviour with brute force
  - Parameterisation I(p)
  - Repeat for each bin
- a parameterization  $I_i(p)$  for each bin
  - N dimension polynomial
  - Including all the correlation terms up to the order of the polynomial
- $\Rightarrow$  Minimise according to  $\overline{I}(p)$ 
  - ∼ 20 parameters
    - This limit is due to disk space requirements
    - It can be overcome
  - Special thanks to H. Schulz



# Advantages and expectations

- All parameters can be tuned
  - Not only reweight-able
  - ⇒ no dedicated machinery to develop
- Advanced features
  - Take into account correlations
  - weights specific for each bin and/or dataset
    - Proper treatment while handling multiple datasets
    - Restrict the fit to particular subsets
  - Priors can be included
  - Nuisance parameters can be inserted
    - proper treatment for datasets without correlations
    - ⇒ MiniBooNE, old bubble chamber datasets
- Professor based Reweight package in development
  - Reweight hard to maintain: each model requires a specific reweight module
  - Better interface with the errors produced by a global fit
  - Allow non-reweightable parameters e.g. HN FSI
  - ⇒ version 4



Conclusion

# Next steps

- Tuning program
  - hadronization retune
    - Pythia 6 and 8 (implementation is ongoing)
  - Tune of FSI
    - Both hN and hA intranuke
  - Free nucleon cross section model
    - ⇒ Julia's talk about RES/DIS transition region
- Data from liquid argon experiments
  - Part of GENIE collaboration is in SBND
  - Plan for argon tunes
- Paper in preparation
- Official code deployed
  - Finalizing the web page for the validation plots



#### GENIE has improved

- New models
- Systematic validation against Cross section data
- Maintained and rich database
- We have a very powerful fitting machinery
  - Validated with many tunes
  - A new branch of analyses
  - Alternative tool to propagate systematic uncertainties
- Researchers are encouraged to contact us to start a collaboration
  - New theory models
  - New experimental collaborations



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Backup slides

#### Production version v2.10.0 - New physics models

- Bodek-Christy-Coopersmith eff. spectral function (EPJC 74:3091, 2014).
   B. Coopersmith and A. Bodek (Rochester)
- Very-High Energy extension (up to 5 TeV, working towards PeV scales)
   K. Hoshina (Wisconsin)
- Inclusive η production.
   J. Liu (W&M)
- Berger-Sehgal resonance model (PRD 76, 113004, 2007)
   J. Nowak (Lancaster) and S. Dytman (Pitt)
- Kuzmin-Lyubushkin-Naumov resonance model (MPL A19, 2815, 2004)
   J. Nowak (Lancaster), I. Kakorin (JINR) and S. Dytman (Pitt)
- Improved INTRANUKE/hA FSI model.
   S. Dytman and N. Geary (Pitt)
- Single K model by Alam, Simo, Athar, and Vacas (PRD 82, 033001, 2010).
   C. Marshall (Rochester) and M. Nirkko (Bern)

# Production version v2.12.0 - New physics models

- Bhattacharya, Hill, and Paz QE Z expansion model (PRD 84:073006)
   A. Meyer (Chicago)
- Local Fermi Gas & Nieves-Amaro-Valverde CCQE with RPA (Phys. Rev. C70, 055503 (2004); Phys. Rev. C72:019902, 2005)
   J. Johnston and S. Dytman (Pitt)
- Updates to the GENIE hown-grown empirical 2p-2h model S.Dytman (Pitt)
- Valencia 2p-2h model (Phys.Rev. D88:113007, 2013)
   J. Schwehr (CSU), D.Cherdack (CSU) and R. Gran (UMD)
- Berger-Sehgal coherent π production (PRD 79:053003, 2009)
   G. Perdue (Fermilab), H. Gallagher (Tufts), D. Cherdack (CSU)
- Alvarez Ruso, Geng, Hirenzaki and Vacas microscopic coherent pion production (PRC 75:055501, 2007; PRC 76:068501, 2007)
   D.Scully, S. Dennis and S. Boyd (Warwick)

#### Production version v2.12.0 - New physics models

- Oset, Salcedo and Strottman FSI model (Phys. Lett. B 165:13, 1985; Nucl. Phys. A 468:631, 1987.)
  - T. Golan (Fermilab and Rochester)
- Kaon FSI improvements
   F. de Maria Blaszczyk (LSU), S. Dytman (Pitt)
- Pais QE Hyperon production model (Ann. Phys. 63:361, 1971)
   J. Poage and H. Gallagher (Tufts)
- Updated Rein diffractive pion model (Nucl.Phys. B278:61, 1986).
   J. Wolcott (Tufts)
- Several resonance model updates.
   L.Jiang (Pittsburgh) and I.Kakorin (JINR & ITEP)
- Kuzmin, Naumov energy-dependent axial-mass model. *I.Kakorin (JINR & ITEP)*

#### Other notable changes in v2.10.0 / v2.12.0

- Upgrade of nucleon decay generator in GENIE.
   M.Sorel (IFIC)
- Simulation of n − n̄ oscillations.
   J. Hewes and G. Karagiorgi (Manchester)
- New Honda, Athar, Kajita, Kasahara and Midorikawa (HAKKM) atm. ν flux (PLB718:1375, 2013) driver added to existing FLUKA and BGLRS ones. G.Majumder, A.Ajmi (INO Collab.); T.Katori (QMUL)
- A new unified event generation app for all Fermilab experiments (in the NuMI, Booster and LBNF beamlines) and updates in the flux drivers.
   R.Hatcher (Fermilab)
- Event reweighting I/O J. Yarba (Fermilab)
- New GSL (GNU Scientific Library) dependency S.Dennis (Warwick/Liverpool)
- "ROOT6 and C++11"-ready!
   S.Dennis (Warwick/Liverpool)
- LHAPDFv5 dependence now optional; CERNLIB/PDFLIB discontinued.
   S.Dennis (Warwick/Liverpool)
- + Bug fixes. For a detailed list see: https://releases.genie-mc.org

#### **GENIE Version 2.12.8**

- CCQE models
  - Llewellyn Smith
  - Nieves, Amaro and Valverde
- MEC models
  - Empirical
  - Nieves Simo Vacas
- Nuclear Models
  - Relativistic Fermi Gas
  - Local Fermi Gas
  - Effective Spectral Functions

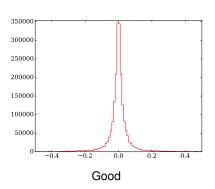


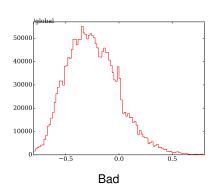
- Single Kaon
- Λ production

- RES
  - Rein-Sehgal
  - Berger-Sehgal
  - Kuzmin-Lyubushkin-Naumov
- COH
  - Rein-Sehgal
  - Berger-Sehgal
  - Alvarez Ruso
- FSI Intranuke
  - Full Intra-Nuclear cascade
  - Schematic based on Hadron-nucleus data
- Only one Comprehensive Model Configuration (CMC)
- Default tune has not changed



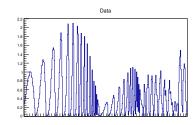
#### Parametrization residuals





# Datasets - 311 data points

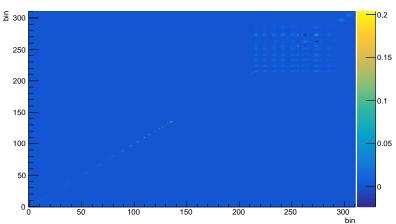
- MiniBooNE  $\nu_{\mu}$  CCQE
  - 2D histogram
  - 137 points
  - No correlation matrix
- MiniBooNE  $\bar{\nu}_{\mu}$  CCQE
  - 2D histogram
  - 78 points
  - No correlation matrix
- T2K ND280 0π (2016) V2
  - 2D histogram
  - 80 points
  - full covariance matrix
- MINERVA  $\nu_{\mu}$  CCQE
  - 1D histogram
  - 8 points
  - full covariance matrix
- MINERvA ν̄<sub>μ</sub> CCQE
  - 1D histogram
  - 8 points
  - full covariance matrix



- Missing Covariance between Neutrino and antineutrino data
  - Minerva released this information!

#### Data covariance

#### **Data Covariance**



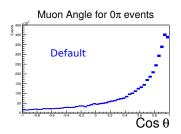
- Parameters best fit
- Parameters covariance
- Prediction covariance
  - due to the propagation of parameter covariance

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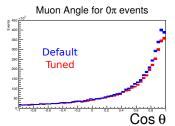
Muon Angle for  $0\pi$  events Default Cos θ  Data Constraints for Oscillation analyses

- Parameters best fit
- Parameters covariance
- Prediction covariance
  - due to the propagation of parameter covariance

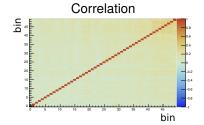
- Data Constraints for Oscillation analyses
  - Propagate the result to other observables



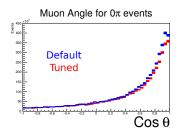




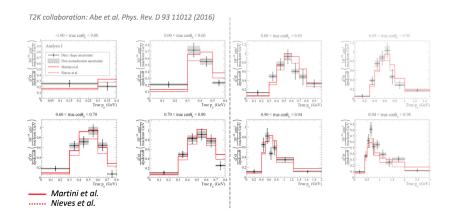
- Parameters best fit
- Parameters covariance
- Prediction covariance
  - due to the propagation of parameter covariance



- Data Constraints for Oscillation analyses
  - Propagate the result to other observables
- Propagate parameters uncertainty through the parameterization



# Model comparison

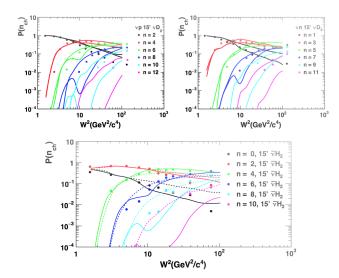


# Model comparison

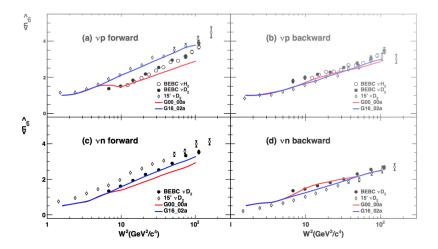
$$\begin{array}{lll} \underline{\textit{Martini et al.}} & \underline{\textit{Nieves et al.}} & \underline{\textit{Amaro et al.}} & \underline{\textit{Lovato et al.}} & \underline{\textit{Bodek et al.}} \\ \frac{\partial^2 \sigma}{\partial \Omega \, \partial \epsilon'} & = & \frac{G_F^2 \, \cos^2 \theta_c}{2 \, \pi^2} k' \epsilon' \, \cos^2 \frac{\theta}{2} \, \left[ \frac{(q^2 - \omega^2)^2}{q^4} \, G_E^2 \, \underline{R_\tau} + \frac{\omega^2}{q^2} \, G_A^2 \, \underline{R_{\sigma\tau(L)}} + \right. \\ & + & 2 \left( \tan^2 \frac{\theta}{2} + \frac{q^2 - \omega^2}{2q^2} \right) \, \left( G_M^2 \, \frac{\omega^2}{q^2} + G_A^2 \right) \, \underline{R_{\sigma\tau(T)}} \pm 2 \, \frac{\epsilon + \epsilon'}{M_N} \, \tan^2 \frac{\theta}{2} \, G_A \, \underline{G_M} \, \underline{R_{\sigma\tau(T)}} \end{array}$$

# [M.Martini, FUNFACT | Lab workshop]

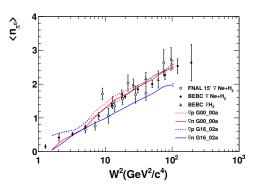
# Hadronization example



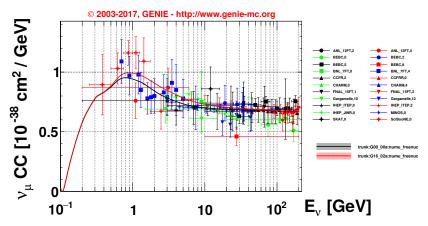
# Hadronization example



# Hadronization example



# Evolving datasets - Old datasets

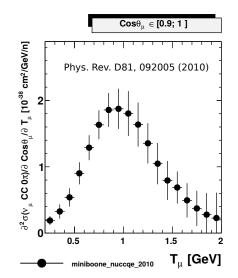


- Functions of  $E_{\nu}$
- "Only" statistical errors

- Ignore nuclear effects
- Poor statistical interpretation
- Poor model discrimination power

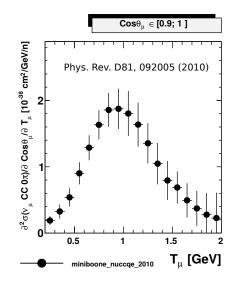
## Evolving datasets - Present datasets

- Functions of experimental observables
- flux-integrated
- Usually differential cross-sections
  - 1D, 2D
- Organized by topology, not process
- Higher statistics
- More statistically robust
  - ⇒ See Fermilab neutrino seminar by Mikael Kuusela - 2017/04/13



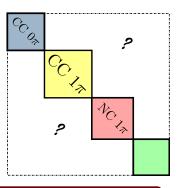
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- Sometimes incomplete
- Helped the development of new models
  - 2p/2h



## Future of datasets - a personal view

- One big covariance matrix per experiment
- Correlation between datasets
- Differential cross sections, dim > 2
- No data releases with this format
  - SBND is thinking about a solution
- It is usually a big effort but ...
  - dedicated experiments



### We finally have a way to use these datsets

- Statistically coherent
- Complete error analysis

## The Comparisons

The GENIE suite contains a package devoted to comparing GENIE predictions against publicly released datasets.

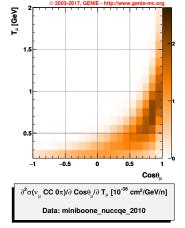
- Provides the opportunity to improve and develop GENIE models
- Crucial database for new GENIE global fit to neutrino scattering data
- All sorts of possible formats and dimensions
- Can store correlations, even between different datasets

### The database

- Modern Neutrino Cross Section measurement
  - nuclear targets
  - typically flux-integrated differential cross-sections
  - MiniBooNE, T2K, MINERvA
- Historical Neutrino Cross Section Measurement
  - Bubble chamber experiment
- Measurements of neutrino-induced hadronic system characteristics
  - Forward/backward hadronic multiplicity distributions
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  - ...
- Measurements of hadron-nucleon and hadron-nucleus event characteristics (for FSI tuning)
  - For pion, Kaons, nucleons and several nuclear targets
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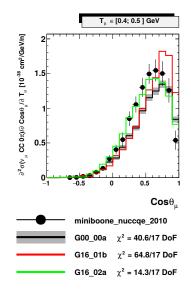
#### MiniBooNE CCQE

- Both  $\nu$  and  $\bar{\nu}$ 
  - Phys. Rev. D81, 092005 (2010)
  - Phys. Rev. D88, 032001 (2013)
- Double differential cross section.
- flux integrated
- No correlations
- Preferred model is Nieves Model (G16 02a)
  - ullet excellent agreement for u
  - $\chi^2 = 101/137 \text{ DoF}$
- ullet worse for  $ar{
  u}$ 
  - $\chi^2 = 176/78 \text{ DoF}$



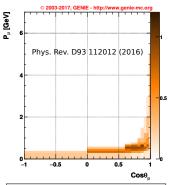
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#### T2K ND280 $0\pi$

- Double differential cross section.
- flux integrated
- Fully correlated
- Tensions between datasets.
- Preferred model is G16 01b
  - $\chi^2 = 135/67 \text{ DoF}$
- all models look reasonable "By eye" estimation
  - · correlation is complicated
  - We can't ignore it!



 $\partial^2 \sigma / \partial \; \text{Cos} \theta_{_{\hspace{-.1em} \text{\tiny $u$}}} / \partial \; P_{_{\hspace{-.1em} \text{\tiny $u$}}} \; [10^{\text{-38}} \; \text{cm}^2/\text{GeV/n}]$ 

Data: t2k nd280 numucc0pi 2015

#### T2K ND280 $0\pi$

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